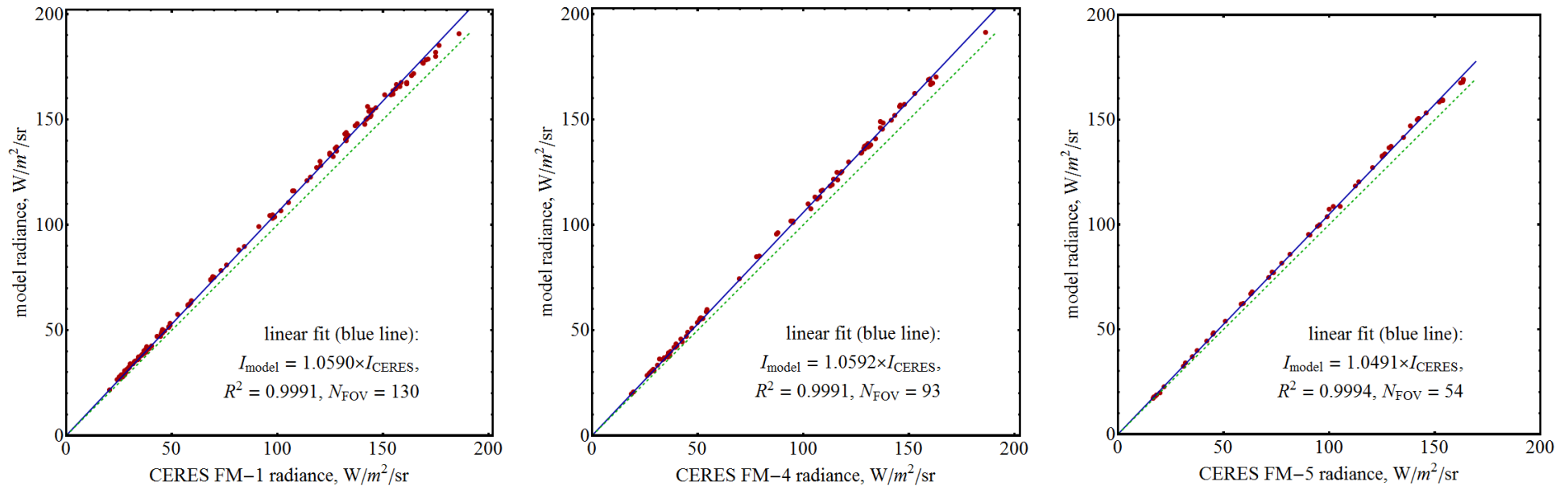


# Analysis of Errors in the modeling of CERES SW observations over Antarctica introduced by the BRDF model

Alexander Radkevich<sup>1)</sup>, Seiji Kato<sup>2)</sup>

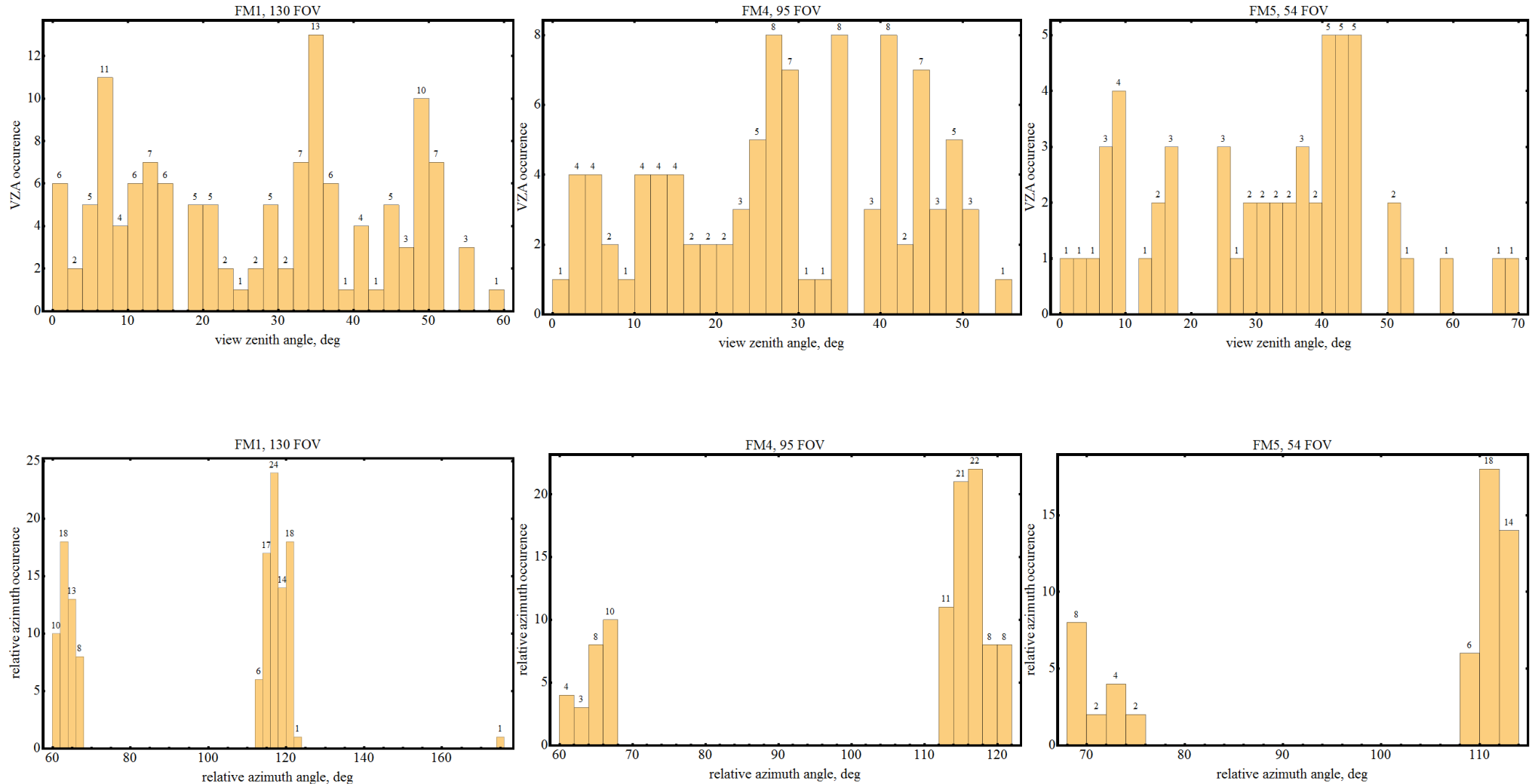
<sup>1)</sup> SSAI, <sup>2)</sup> NASA LaRC

# Current results of the modeling



- High correlation between the model and observations.
- FM-5 sensor is known to be slightly brighter than other instruments.
- We still need to find a reason for  $\sim 5\%$  discrepancy.

# CERES viewing geometry



All observations are clustered in the relatively narrow azimuth sector.

For this reason, only results in azimuth plane  $\phi = 63^\circ$  ( $117^\circ$ ) are reported in this study.

# BRDF model recap 1: what was measured in Dome C and how it was reported

Hudson, S. R., S. G. Warren, R. E. Brandt, and T. C. Grenfell. 2006. "Spectral bidirectional reflectance of Antarctic snow: Measurements and Parameterization." *JGR* 111: D18106.

- spectral resolution: 25 nm; spectral range: 350 – 2400 nm;
- reflected spectral radiance was measured on a set of 6 VZA: (7.5°, 22.5°, 37.5°, 52.5°, 67.5°, 82.5°) and a number of azimuth directions;
- simultaneous measurements of reflected spectral irradiance;
- down- and up-welling irradiances under complete overcast.

The results were reported in the form of:

- the ratio of reflected radiance and irradiance under natural (blue-sky) illumination; it was called anisotropic reflection factor  $R$ ;
- albedo under overcast conditions (it serves as a very accurate surrogate of bi-hemispherical reflection, a.k.a. white-sky albedo).

# BRDF and related quantities

$$\rho(\theta_i, \theta_r, \phi_i - \phi_r) = \frac{I_r(\theta_i, \theta_r, \phi_i - \phi_r)}{F_0(\theta_i, \phi_i)} \quad \text{BRDF}$$

$$I_r(\theta_i, \theta_r, \phi_i - \phi_r) \quad \text{Reflected radiance}$$

$$F_0(\theta_i, \phi_i) \quad \text{Illuminating irradiance (incoming flux) coming from a single direction } (\theta_i, \phi_i)$$

BRDF cannot be measured under natural light illumination (blue-sky) conditions: light comes to the surface from the solid angle of  $2\pi$

$$\rho(\theta_i, \theta_r, \phi) = \frac{1}{\pi} \frac{\pi I_r(\theta_i, \theta_r, \phi)}{F_r(\theta_i)} \frac{F_r(\theta_i)}{F_0(\theta_i)} = \frac{1}{\pi} \Re(\theta_i, \theta_r, \phi) a_{black-sky}(\theta_i)$$

$$F_r(\theta_i) = \int_0^{2\pi} d\phi \int_0^{\pi/2} d\theta_r \sin \theta_r \cos \theta_r I_r(\theta_i, \theta_r, \phi) \quad \text{Reflected irradiance (outcoming flux) under monodirectional illumination}$$

$$\Re(\theta_i, \theta_r, \phi) = \frac{\pi I_r(\theta_i, \theta_r, \phi)}{F_r(\theta_i)} \quad \text{True anisotropic reflection factor}$$

$$a_{black-sky}(\theta_i) = \frac{F_r(\theta_i)}{F_0(\theta_i)} \quad \text{Directional-hemispherical reflectance (black sky albedo, BSA)}$$

$$R(\theta_i, \theta_r, \phi, \text{atm}) = \frac{\pi I_r^{\text{measured}}(\theta_i, \theta_r, \phi)}{F_r^{\text{measured}}(\theta_i)} \quad \text{Measured anisotropic reflection factor}$$

# BRDF model recap 2: the use of measurements in Dome C

$$\rho(\theta_i, \theta_r, \phi) \approx \frac{1}{\pi} R(\theta_i, \theta_r, \phi) a_{black-sky}^{model}(\theta_i)$$

Approximations:

Does not depends on  
atmospheric conditions

$$\mathfrak{R}(\theta_i, \theta_r, \phi) \approx R(\theta_i, \theta_r, \phi)$$

Depends on  
atmospheric conditions

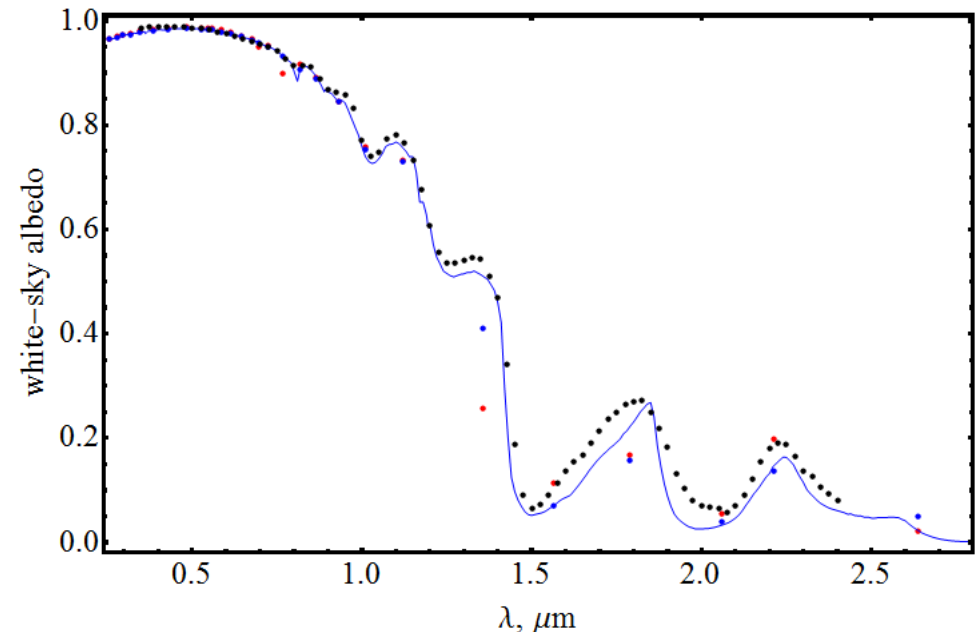
$$a_{black-sky}^{real}(\theta_i) \approx a_{black-sky}^{model}(\theta_i)$$

$$a_{white-sky}^{model} = 2 \int_0^{\pi/2} d\theta_i \sin \theta_i \cos \theta_i a_{black-sky}^{model}(\theta_i)$$

Model BSA comes from the RT modeling of a *flat* snowpack providing the closest match of white-sky albedo (WSA) with the measured albedo under overcast conditions.

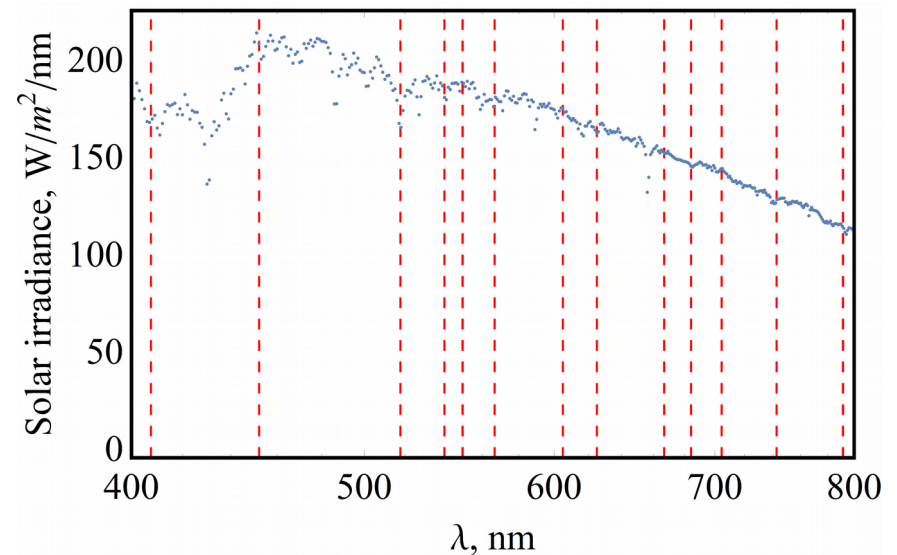
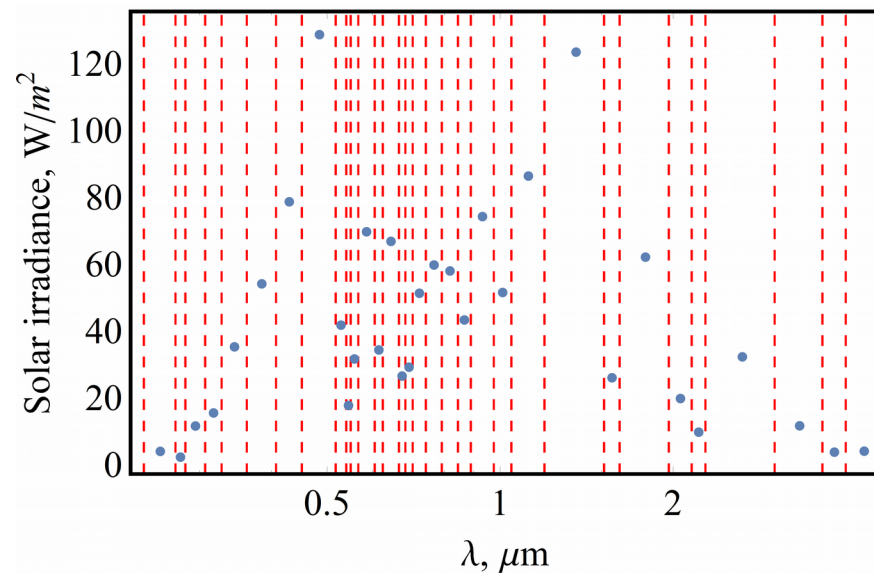
Possible problems:

- 1) Directional distribution of light reflected from a rough surface differs from that for a flat one, so matching of WSA may provide a wrong choice of the overall brightness;
- 2) Both true ARF and BSA are approximated, so that reciprocity of BRDF is not guaranteed:  $R(\theta_i, \theta_r, \phi) a(\theta_i) \neq R(\theta_r, \theta_i, \phi) a(\theta_r)$



# Radiative transfer model

- 32 bands covering CERES SW band;
- monochromatic calculations performed by DISORT;
- accounts for Rayleigh scattering;
- gas absorption (correlated-k (Kato et al. 1999), HITRAN 2000);
- clouds and aerosol scattering and absorption (if any);
- auxiliary data (surface pressure, O<sub>3</sub> and water vapor concentrations, and surface elevation) come from re-analysis used in CERES production – GEOS4 (2000 – 2007), GEOS5 (2008 – present);
- accurate bottom boundary condition.



Bands 7 through 18 covering spectral range from 407 nm to 791 nm are used in this study. They are the most reflective bands accumulating total solar irradiance of  $636 \text{ W/m}^2$ .

# BRDF model recap 3: limited SZA range

Surface boundary condition to the RTE

$$I(\tau = \tau_{surf}, \theta > \pi/2, \phi) = I_0 \cos \theta_s \rho(\theta_s, \theta, \phi) \exp(-\tau_{surf}/\cos \theta_s) \\ + \int_0^{2\pi} d\phi' \int_0^{\pi/2} \sin \theta' d\theta' \cos \theta' \rho(\theta', \theta, \phi - \phi') I(\tau = \tau_{surf}, \theta', \phi')$$



BRDF  $\rho(\theta_i, \theta_r, \phi)$  is needed on  $0^\circ \leq \theta_i \leq 90^\circ$ ;  
 $R(\theta_i, \theta_r, \phi)$  was measured on  $51.6^\circ \leq \theta_i \leq 86.6^\circ$

assumptions:

1)  $R(\theta_i = 0, \theta_r, \phi) = 1$

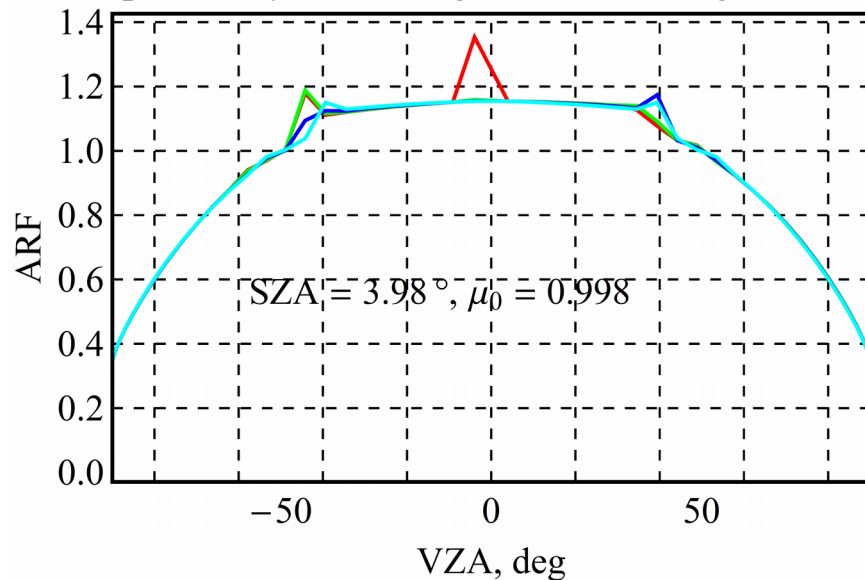
$$R(0^\circ < \theta_i < 51.6^\circ, \theta_r, \phi) \\ = [(1 - \cos \theta_i) R(\theta_i = 51.6^\circ, \theta_r, \phi) + (\cos \theta_i - \cos 51.6^\circ)] / (1 - \cos 51.6^\circ)$$

2)  $R(\theta_i > 86.6^\circ, \theta_r, \phi) \approx R(\theta_i = 86.6^\circ, \theta_r, \phi)$

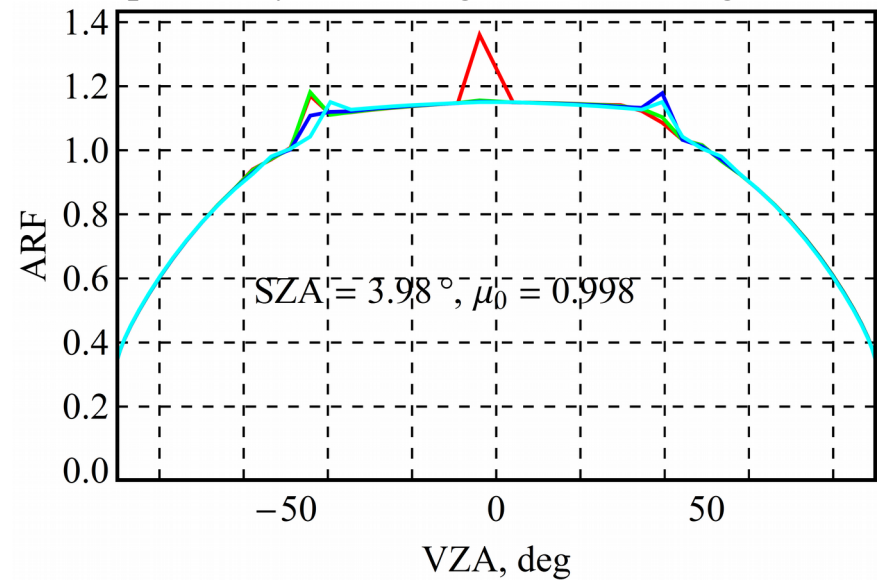


# Is reflection isotropic under overhead sun?

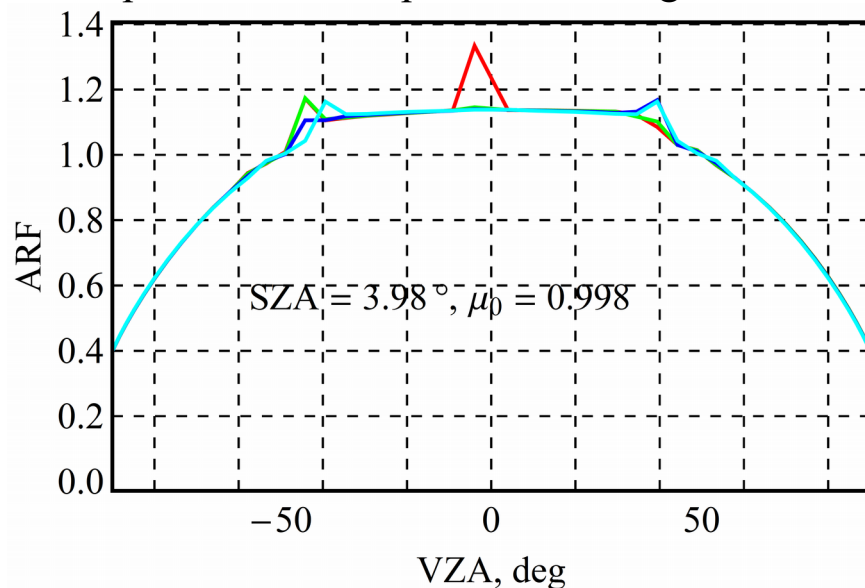
Snowpack only, wavelength 0.549 through 0.567  $\mu\text{m}$



Snowpack only, wavelength 0.667 through 0.684  $\mu\text{m}$



Snowpack with atmosphere, wavelength 0.8  $\mu\text{m}$



$$R(\theta_i = 0, \theta_r, \phi) = 1$$

is a wrong assumption  
azimuth rotational symmetry holds

All graphs show ARF in 4 azimuth planes:

red –  $\phi = 0^\circ$  ( $180^\circ$  for negative VZA),

green –  $\phi = 30^\circ$  ( $210^\circ$ ),

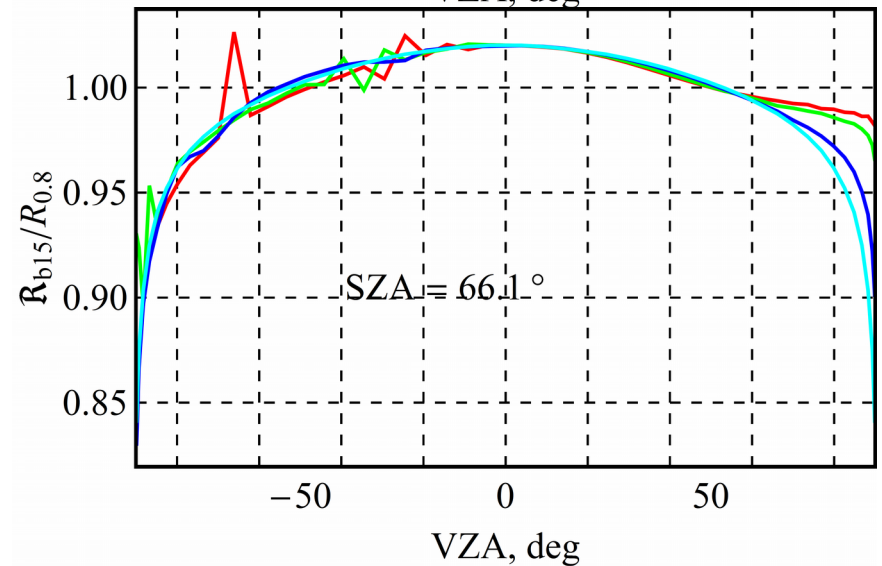
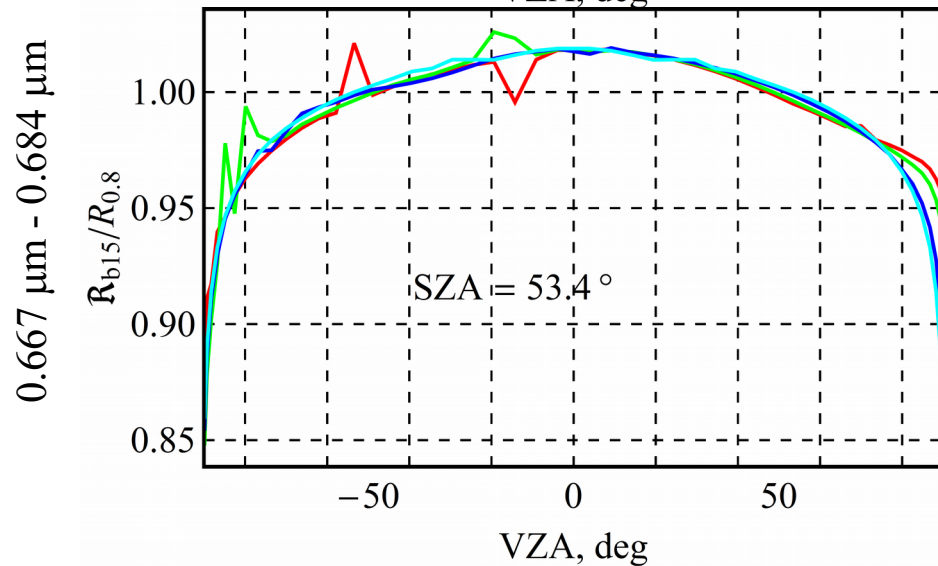
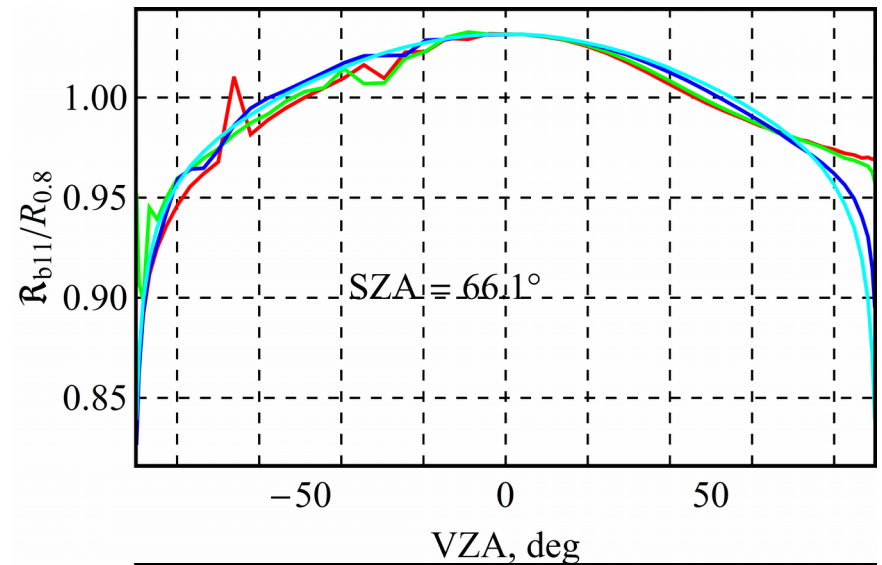
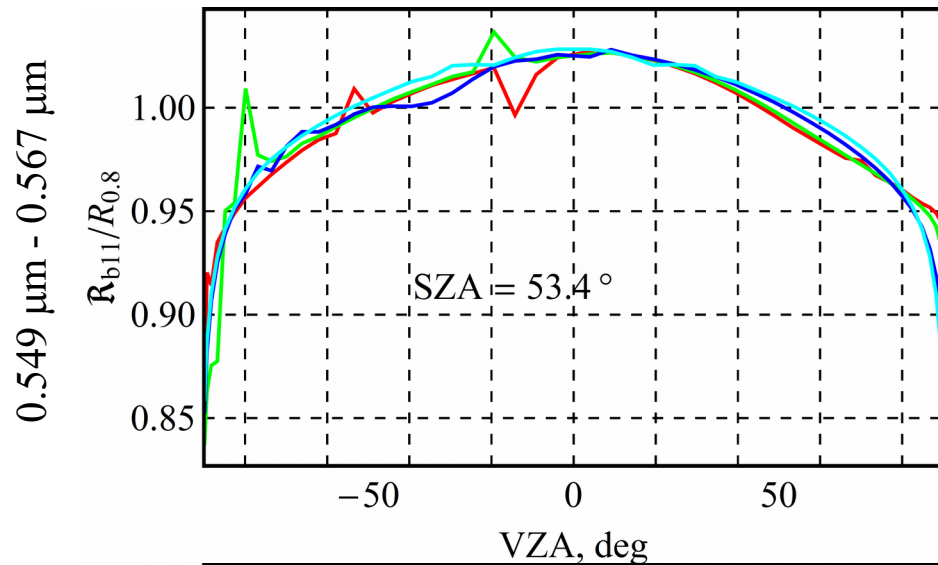
blue –  $\phi = 60^\circ$  ( $240^\circ$ ),

cyan –  $\phi = 90^\circ$  ( $270^\circ$ ).

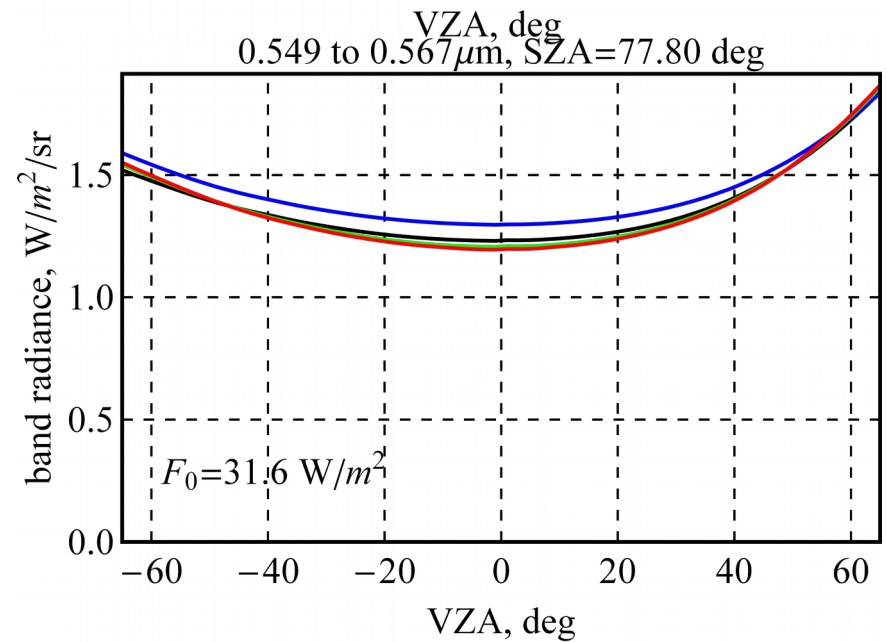
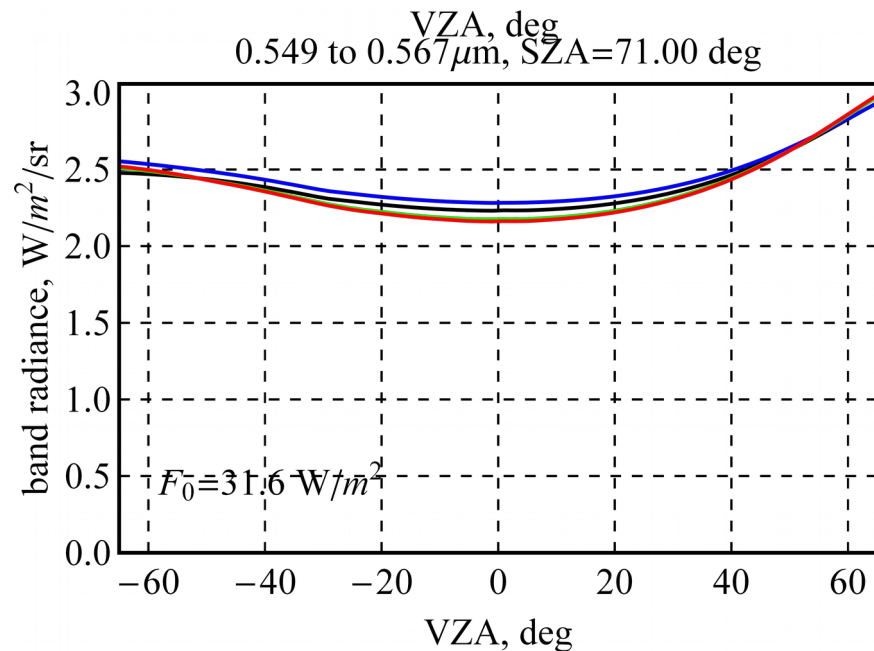
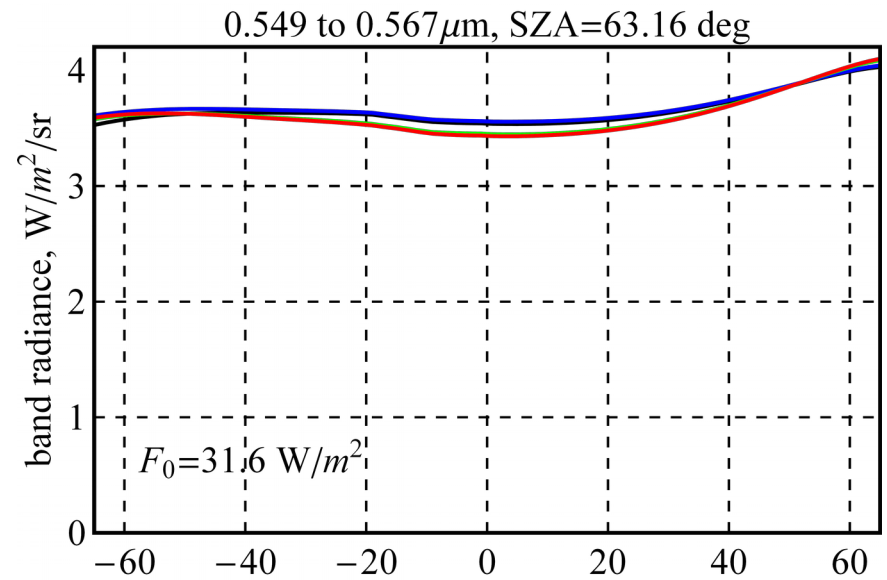
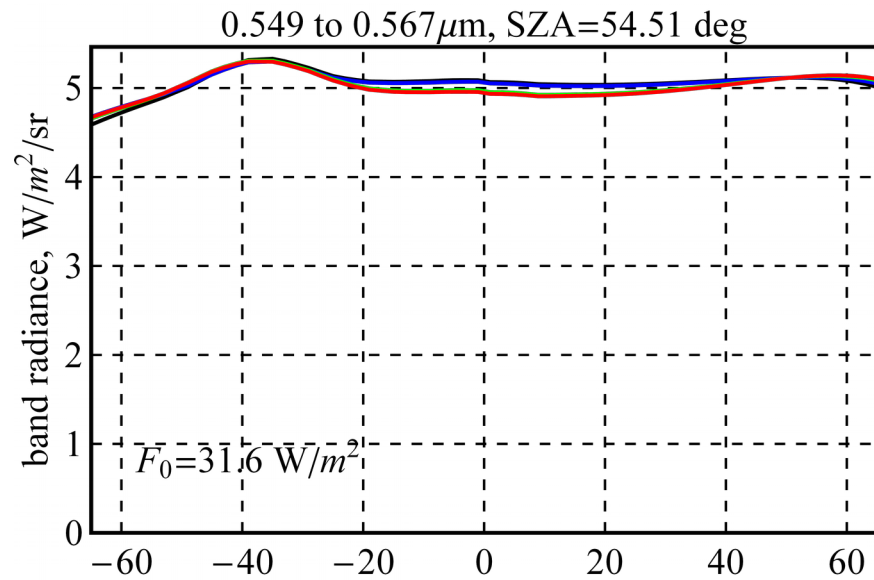
# BRDF model recap 4: spectral dependence

$$R(\theta_i, \theta_r, \phi, \lambda < 0.8 \mu m) \approx R(\theta_i, \theta_r, \phi, \lambda = 0.8 \mu m)$$

$R(\lambda = 0.8 \mu m)$  better approximates  $\Re(\lambda = 0.8 \mu m)$  than  $R(\lambda = 0.5 \mu m)$  does  $\Re(\lambda = 0.5 \mu m)$ . However,  $R(\lambda = 0.8 \mu m) \neq \Re(\lambda < 0.8 \mu m)$

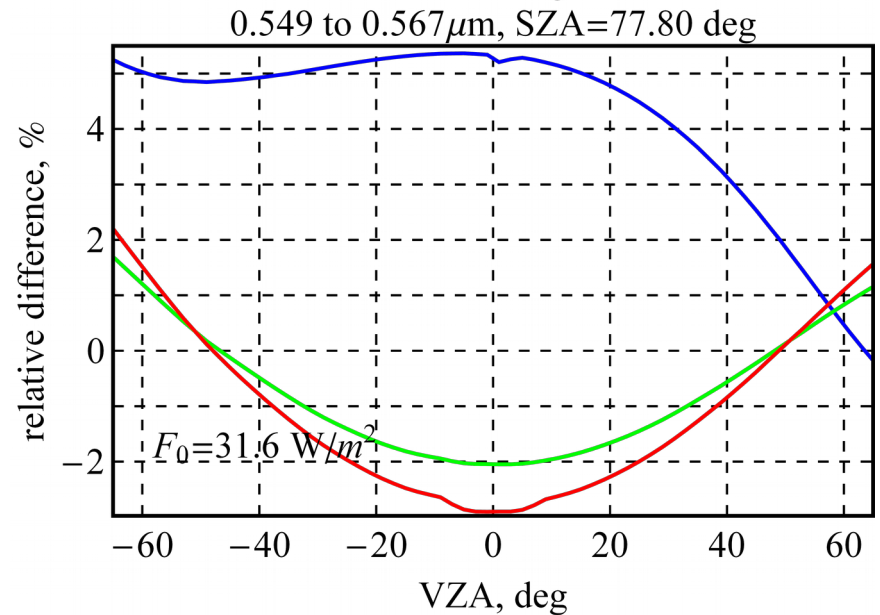
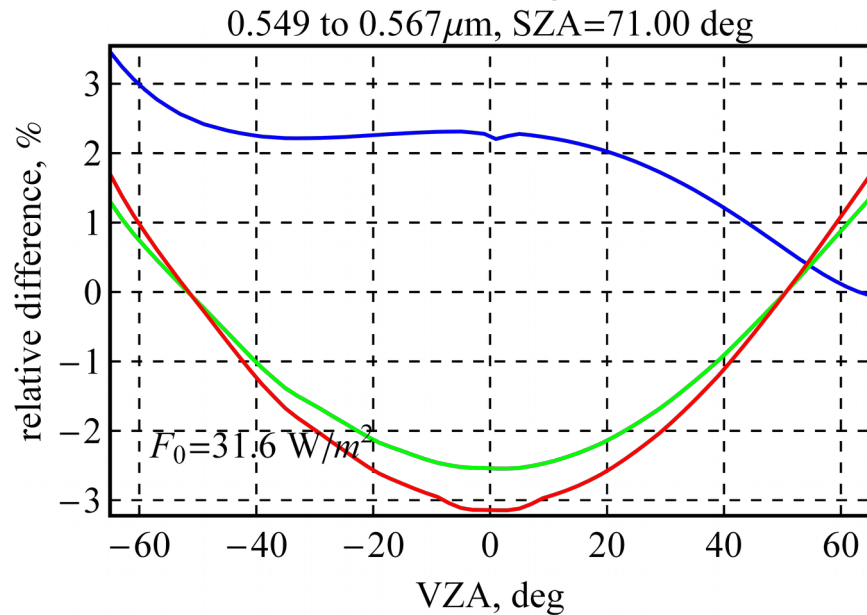
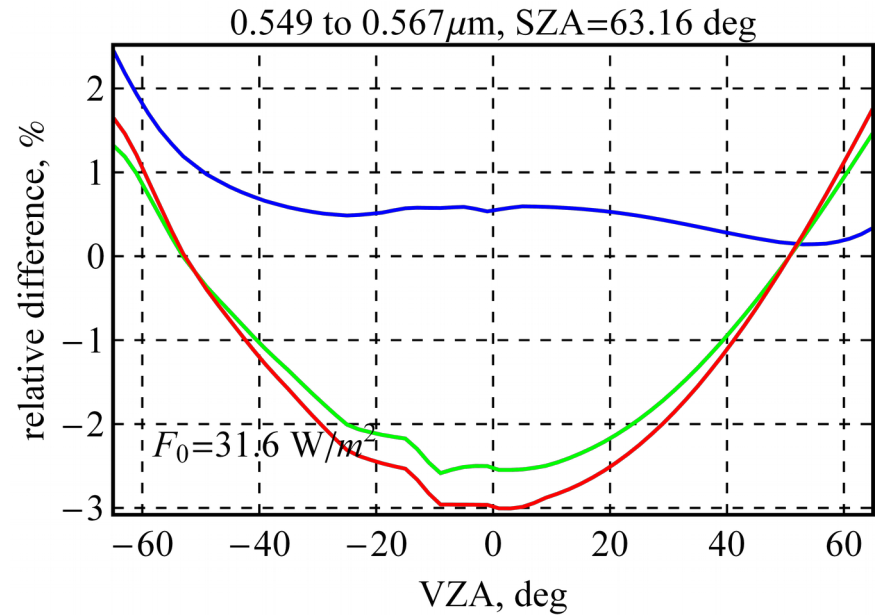
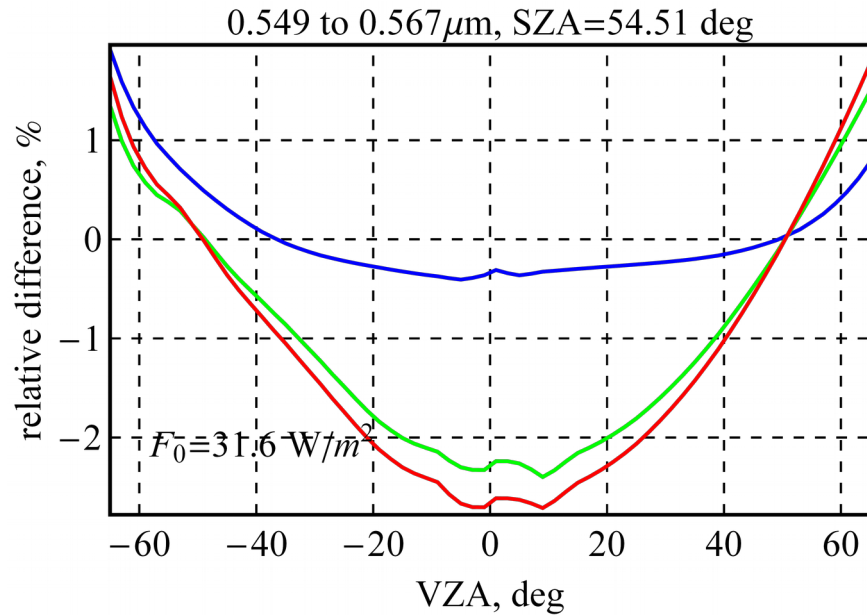


# Modeling results: TOA radiance, band 11



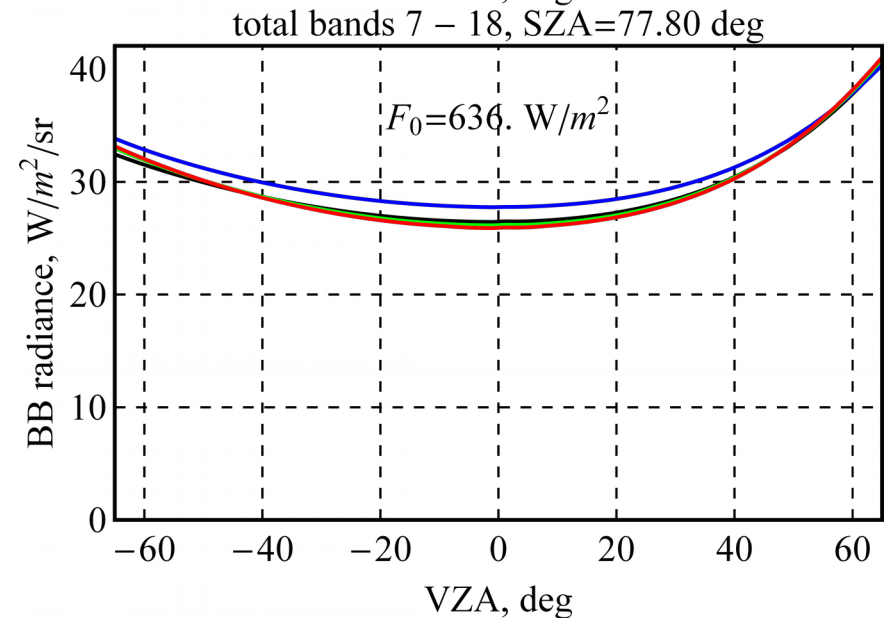
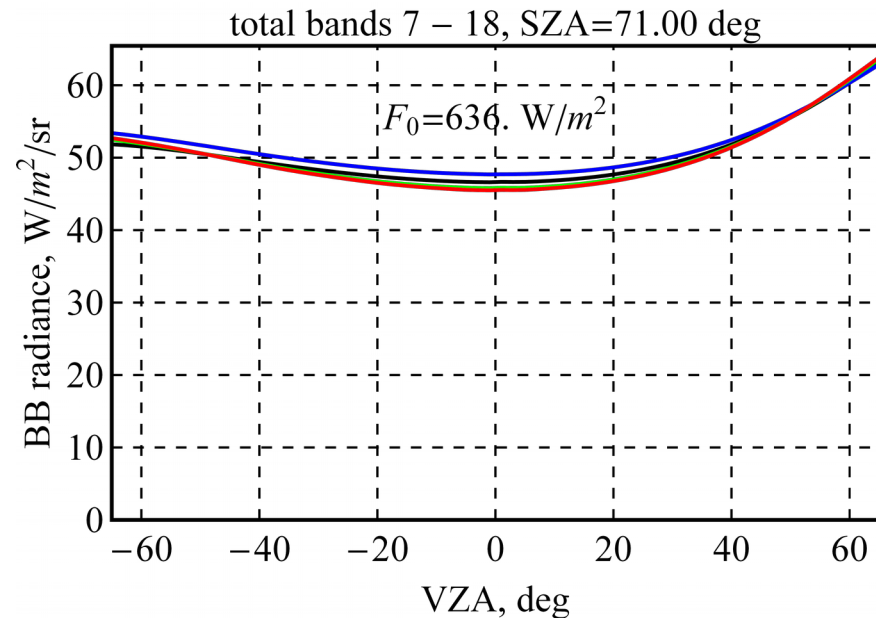
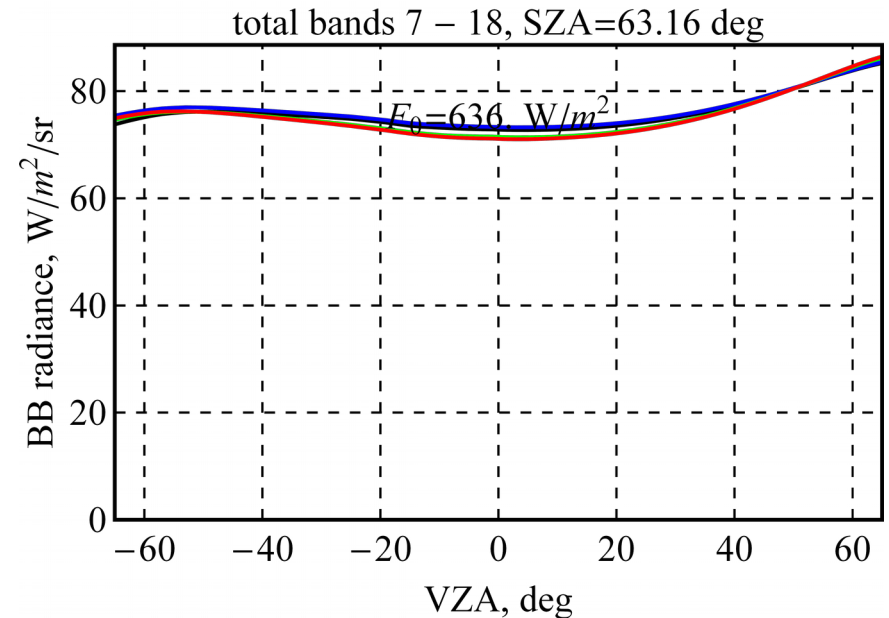
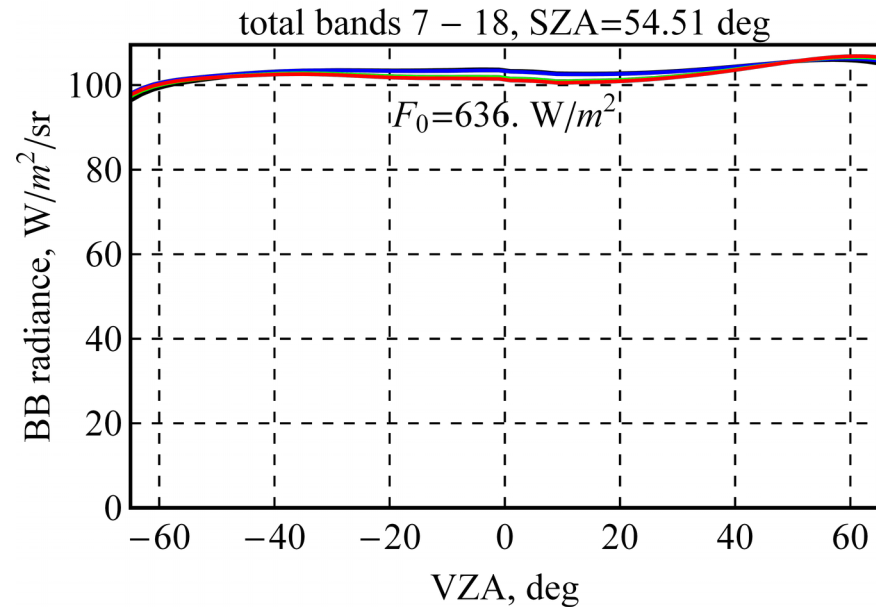
band radiance over spectral interval 0.549  $\mu\text{m}$  through 0.567  $\mu\text{m}$ : black – snowpack-only ARF, blue – snowpack+atmosphere ARF (model of measurable quantity), green – the same as blue but ARF at 0.8  $\mu\text{m}$ , red – the same as green but with interpolation over SZA. RAA = 63° for positive VZA, RAA = 117° negative.

# Modeling results: relative error, band 11



Relative error of band radiance over spectral interval 0.549  $\mu\text{m}$  through 0.567  $\mu\text{m}$ : **blue** – snowpack+atmosphere ARF (model with measurable quantity), **green** – the same as **blue** but ARF at 0.8  $\mu\text{m}$ , **red** – the same as **green** but with interpolation over SZA. RAA = 63° for positive VZA, RAA = 117° negative.

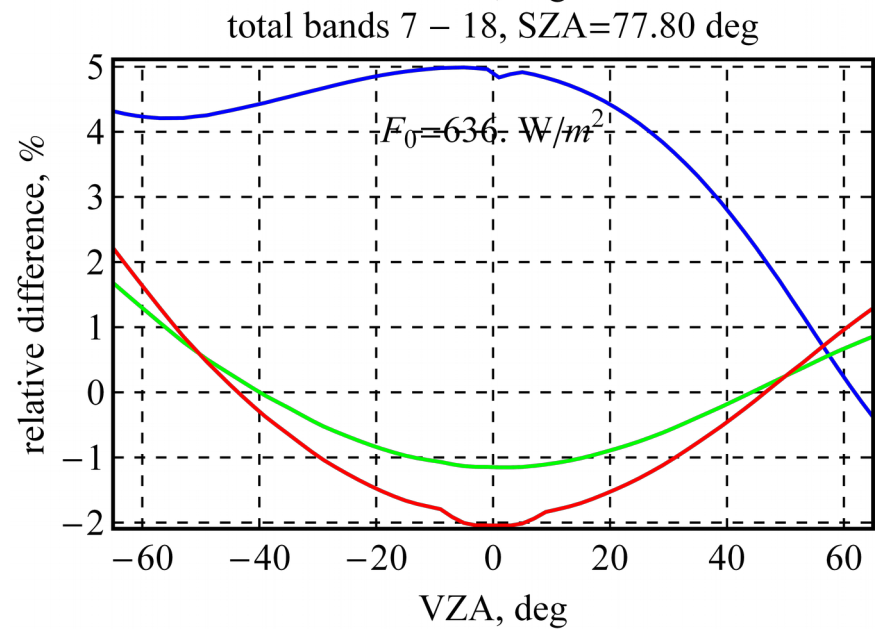
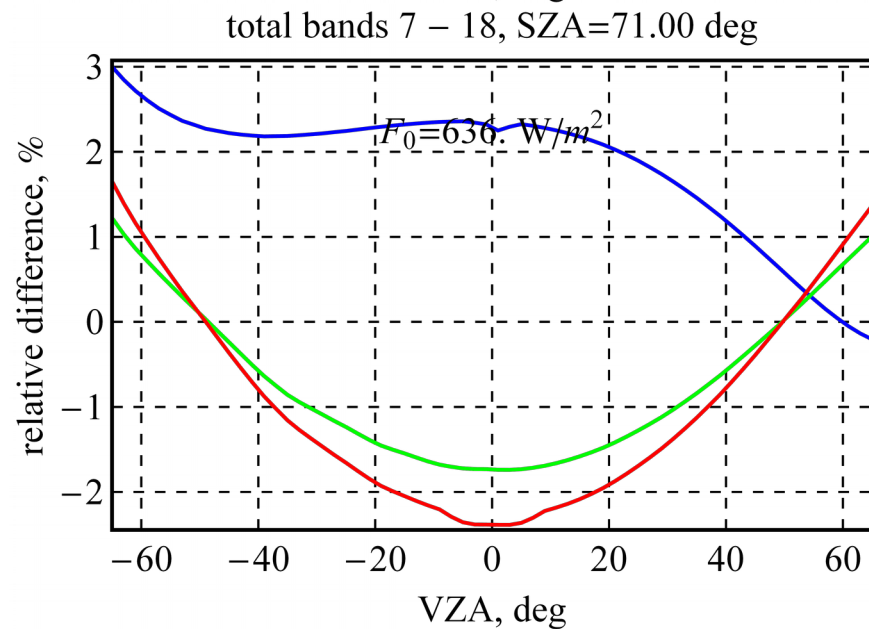
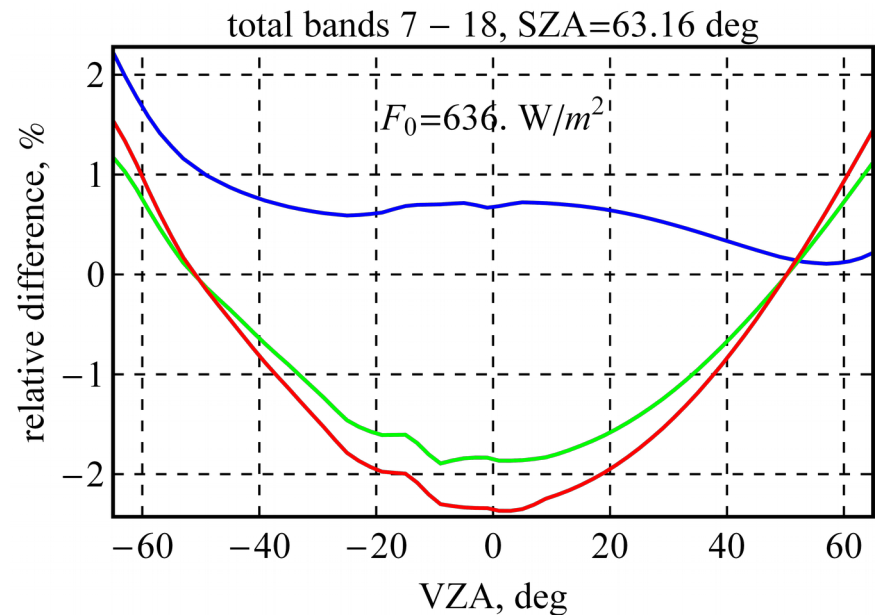
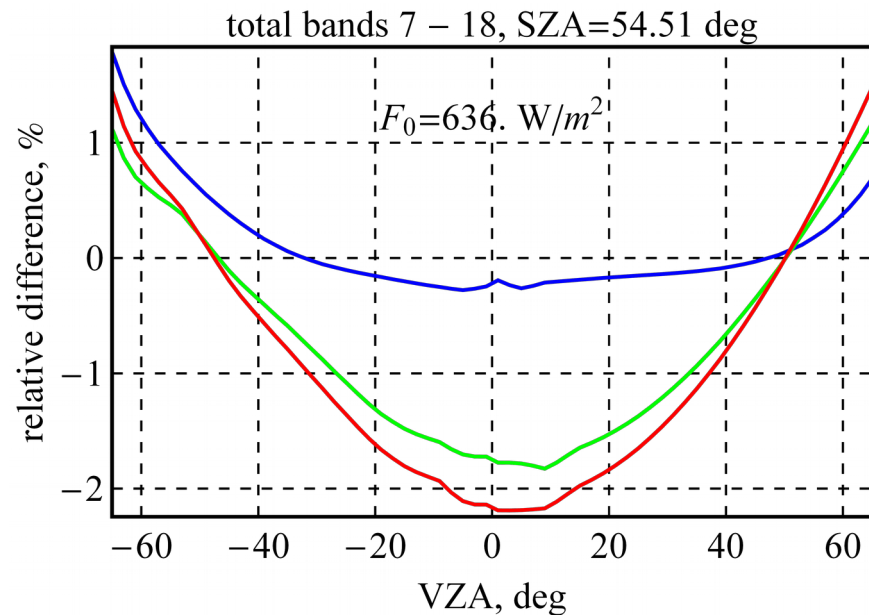
# Modeling results: total TOA radiance



Broadband radiance over spectral interval  $0.407 \mu m$  through  $0.791 \mu m$ : black – snowpack-only ARF, blue – snowpack+atmosphere ARF (model of measurable quantity), green – the same as blue but ARF at  $0.8 \mu m$ , red – the same as green but with interpolation over SZA. RAA =  $63^\circ$  for positive VZA, RAA =  $117^\circ$  negative.



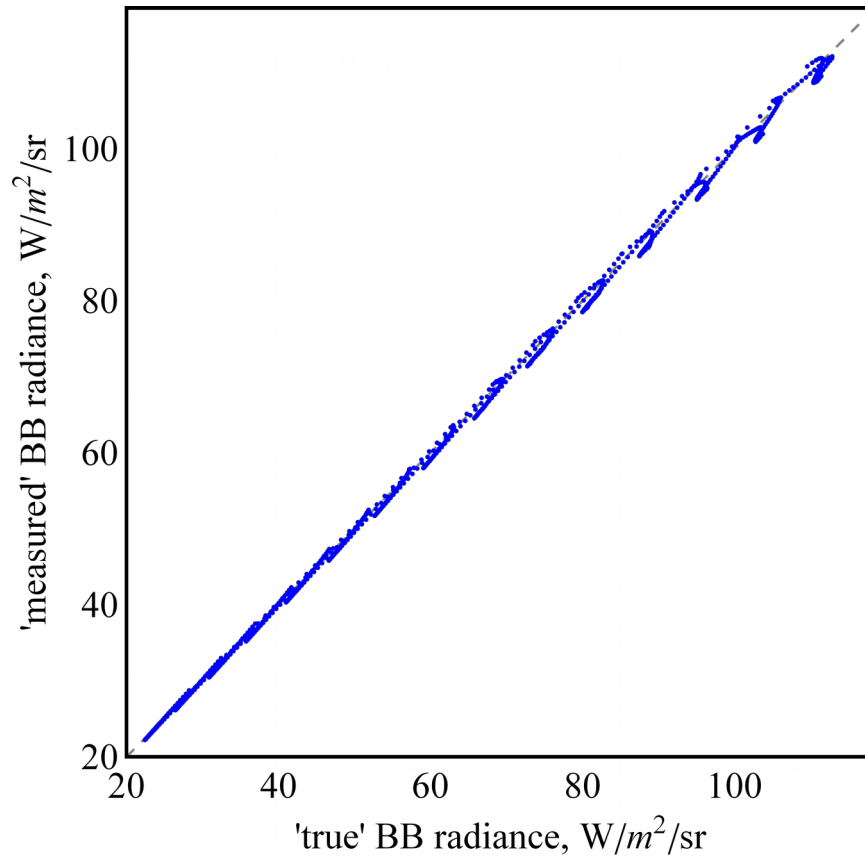
# Modeling results: total radiance relative difference



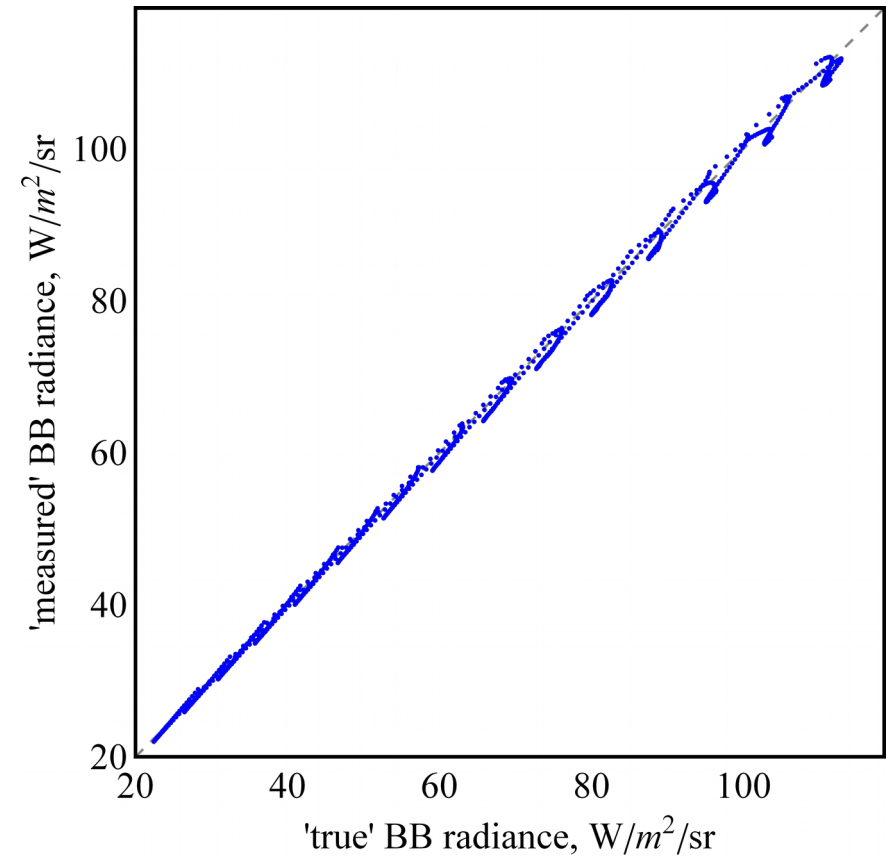
Relative error of broadband radiance over spectral interval  $0.407 \mu\text{m}$  through  $0.791 \mu\text{m}$ : **blue** – snowpack+atmosphere ARF (model of measurable quantity), **green** – the same as **blue** but ARF at  $0.8 \mu\text{m}$ , **red** – the same as **green** but with interpolation over SZA. RAA =  $63^\circ$  for positive VZA, RAA =  $117^\circ$  negative.

# Total TOA radiance modeled with 'true' and 'measured' ARF

“Measured” ARF: snowpack + atmosphere,  
no interpolation, no spectral assumptions,  
regression:  $I_{\text{measured\_ARF}} = 1.0064 * I_{\text{true\_ARF}}$



“Measured” ARF: snowpack + atmosphere,  
SZA interpolation,  $R_{\lambda < 0.8} \rightarrow R_{\lambda = 0.8}$ ,  
regression:  $I_{\text{measured\_ARF}} = 0.9917 * I_{\text{true\_ARF}}$



# Conclusion

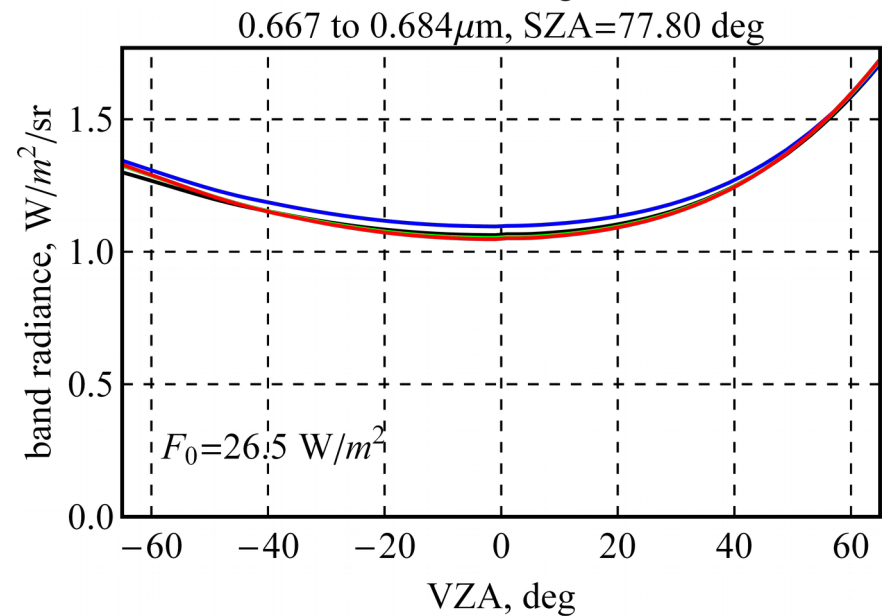
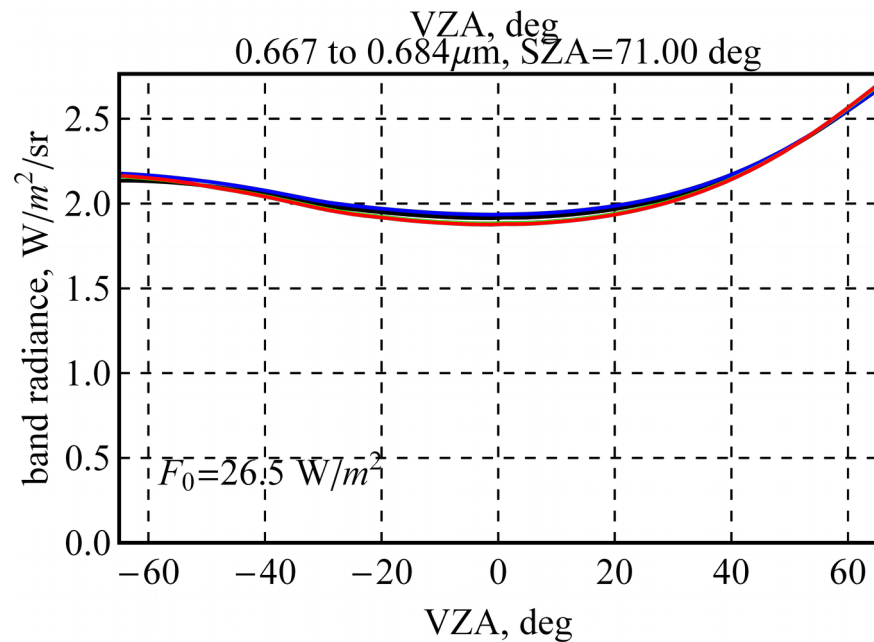
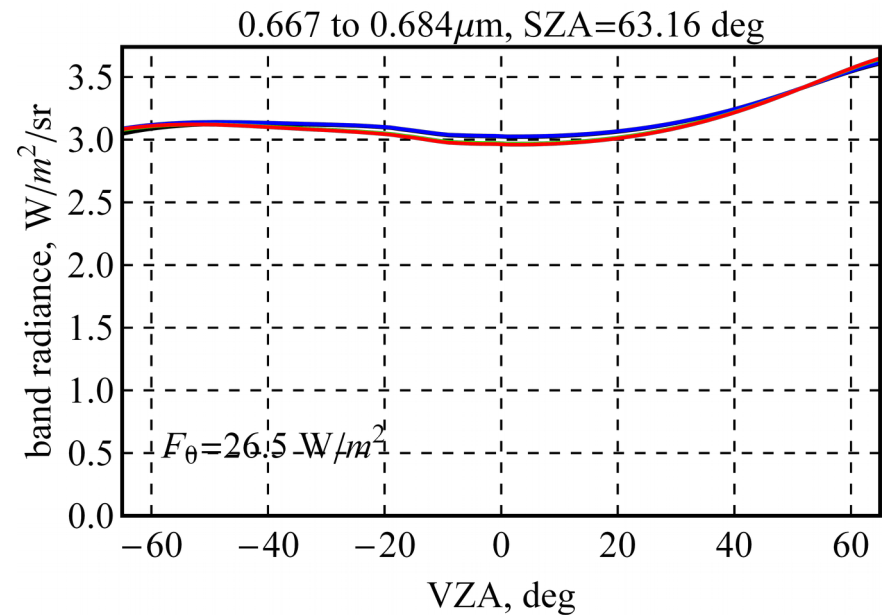
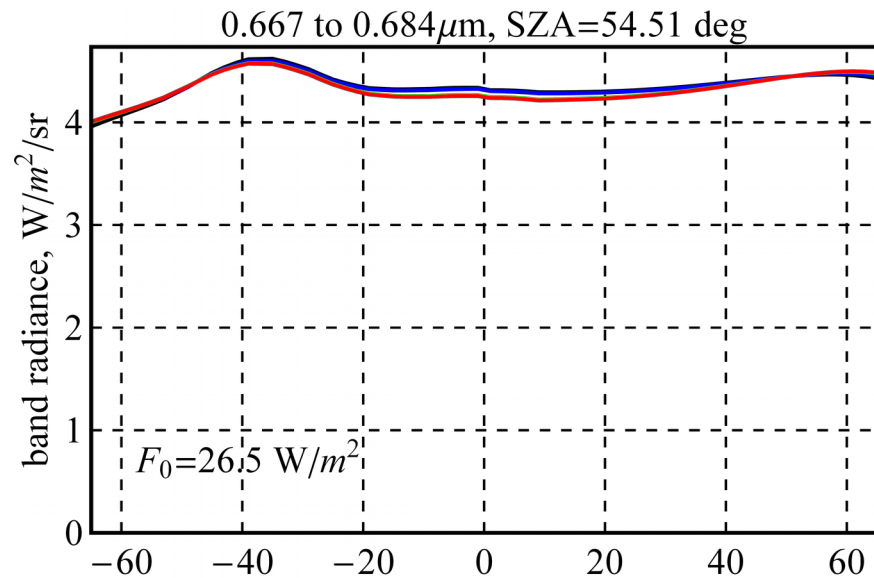
1. Assumption that ARF measured at the surface under blue sky condition can replace true ARF is not valid;
2. Assumption that ARF at 0.8  $\mu\text{m}$  can accurately replace ARF at shorter wavelengths is not valid;
3. Assumption that reflection is isotropic under zenith Sun is not valid;
4. Altogether the assumptions above lead to “lucky” cancellation of errors;
5. Thus, the actual reason for  $\sim 5\%$  discrepancy between modeled and CERES measured radiance remains unclear.

## Future work: how to resolve the problem

1. An algorithm of BRDF retrieval from ground measured radiance was developed;
2. The algorithm requires:
  - a) measured radiance (not yet available);
  - b) kernel-based BRDF model, e.g. MODIS BRDF;
3. Once data are available some tuning of BRDF kernels may be needed to accommodate specific features of snow.

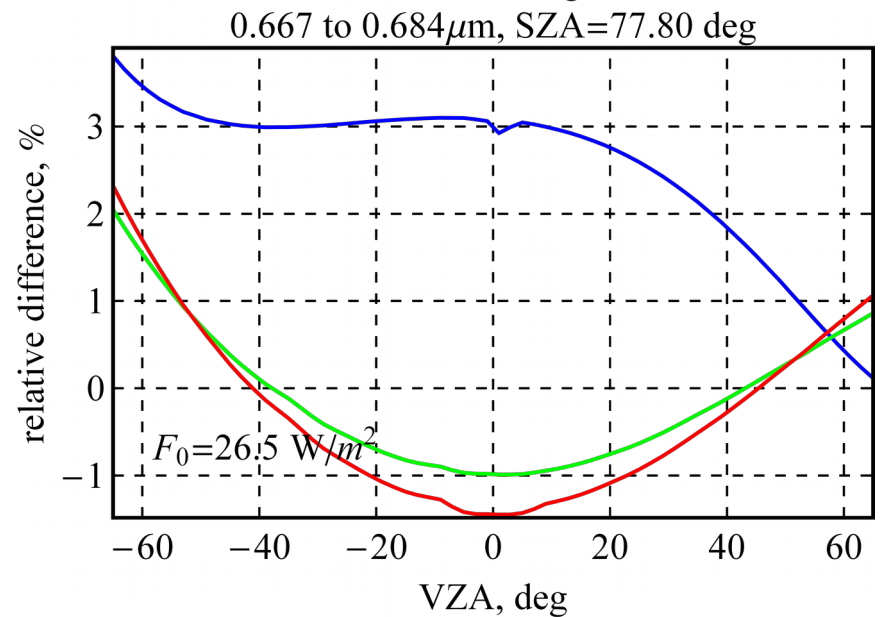
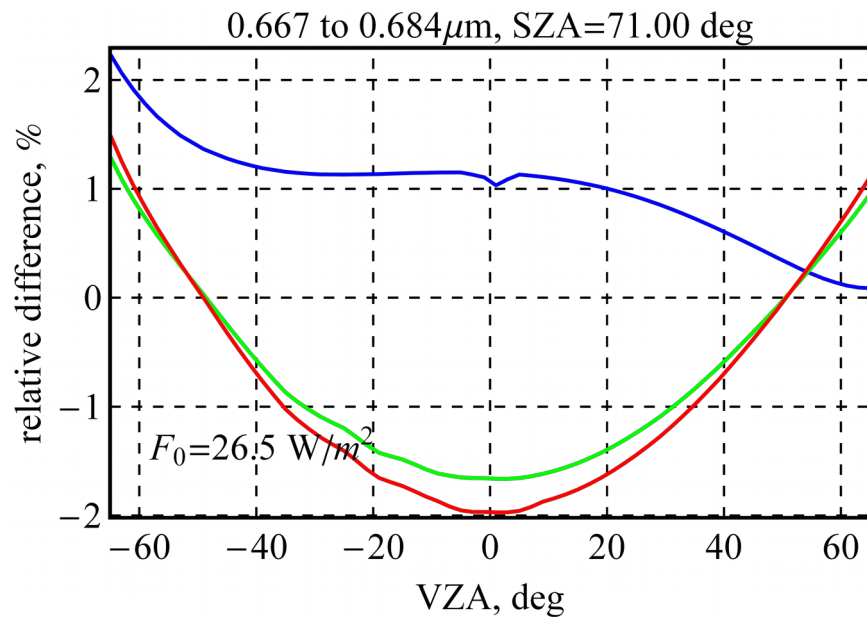
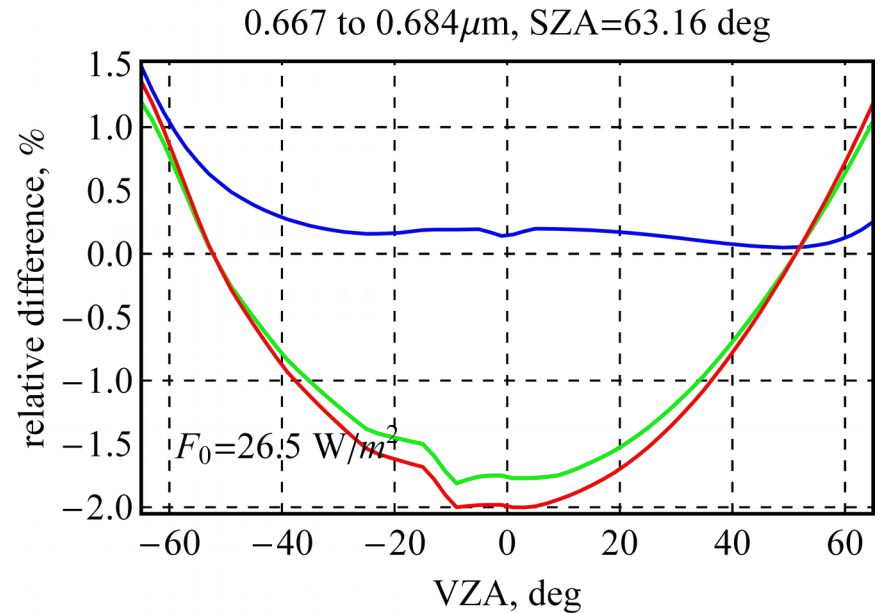
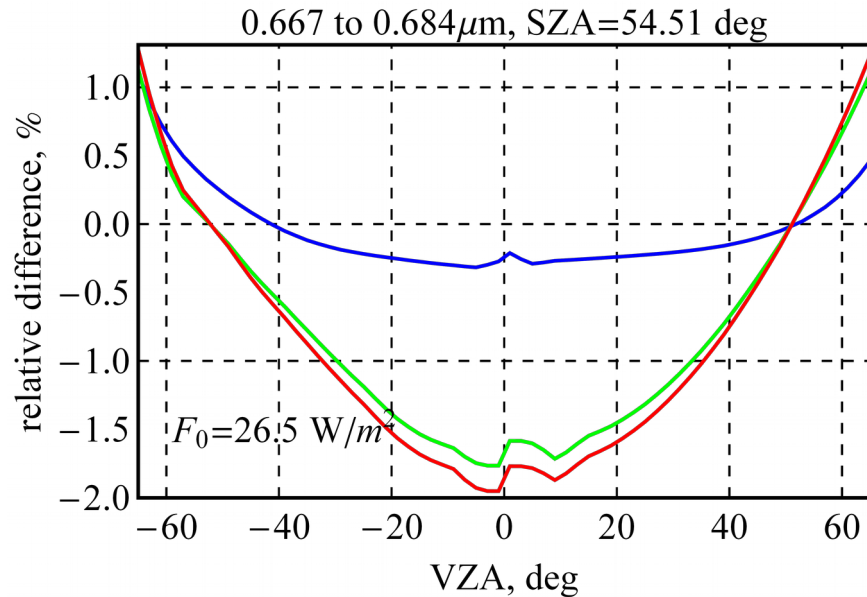


# Modeling results: TOA radiance, band 15



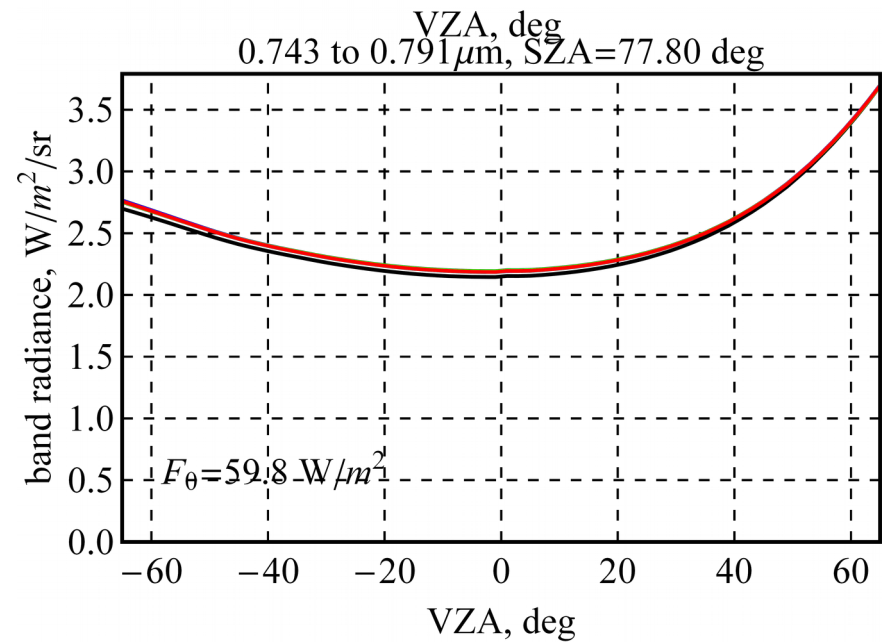
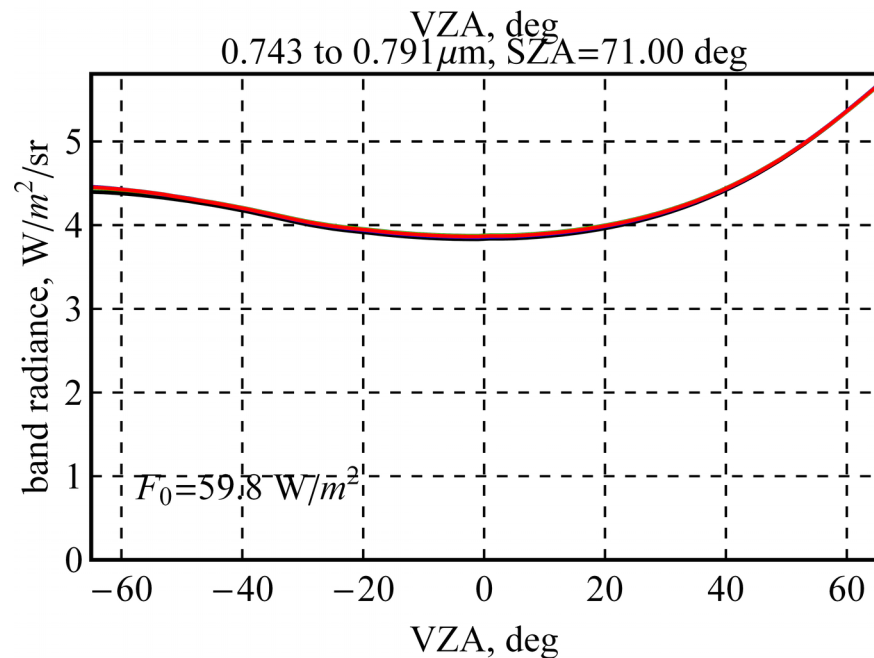
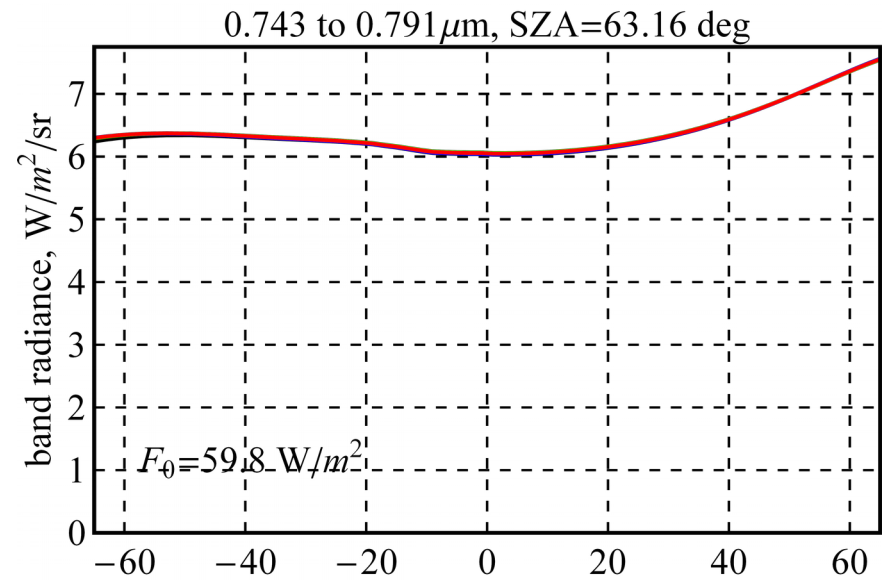
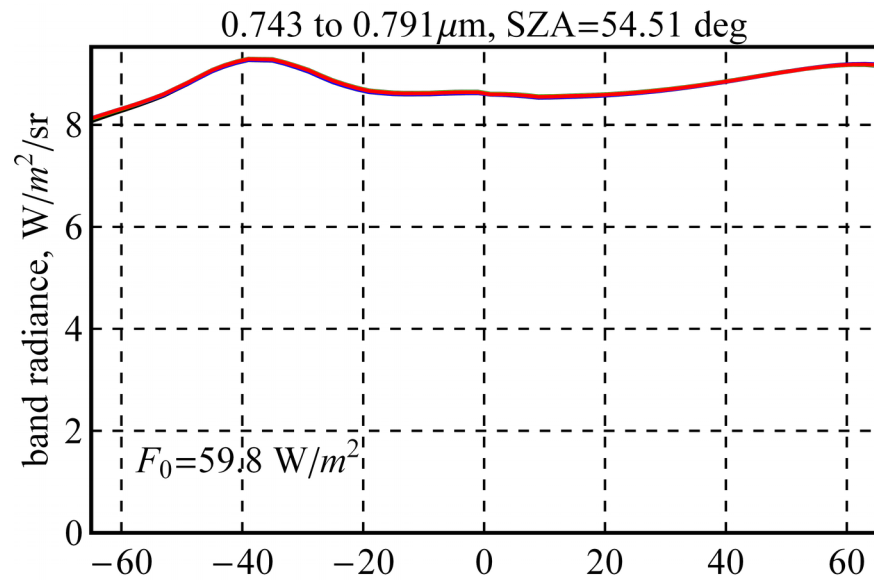
band radiance over spectral interval 0.667  $\mu\text{m}$  through 0.684  $\mu\text{m}$ : black – snowpack-only ARF, blue – snowpack+atmosphere ARF (model of measurable quantity), green – the same as blue but ARF at 0.8  $\mu\text{m}$ , red – the same as green but with interpolation over SZA. RAA = 63° for positive VZA, RAA = 117° negative.

# Modeling results: relative error, band 15



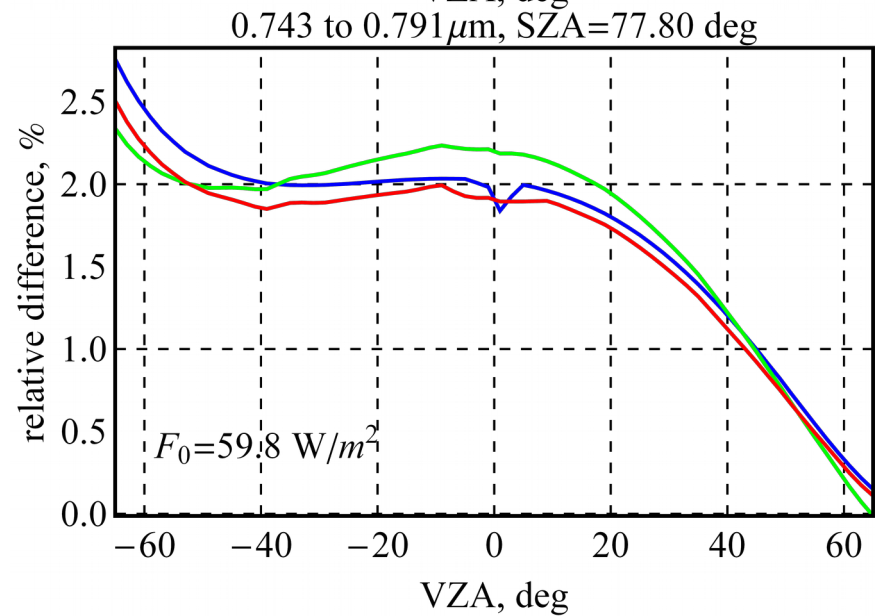
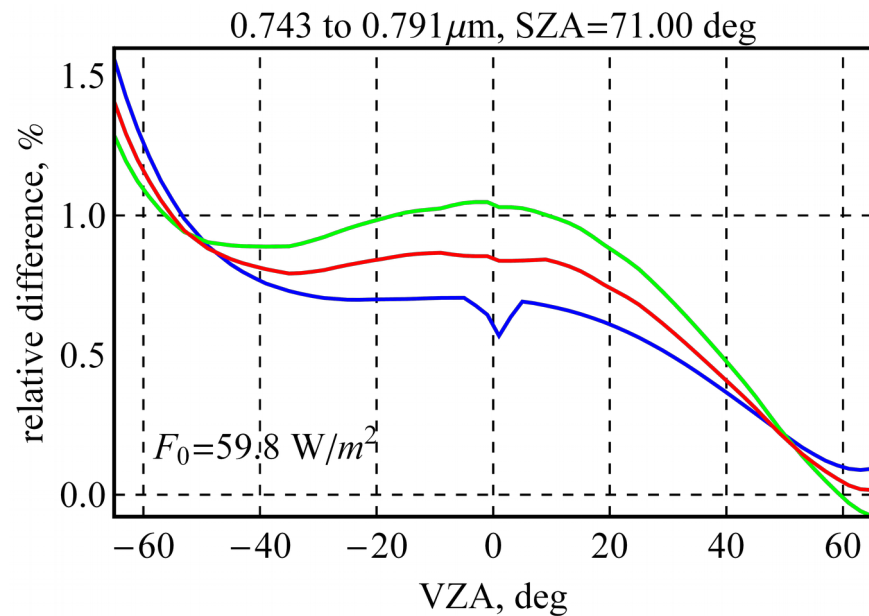
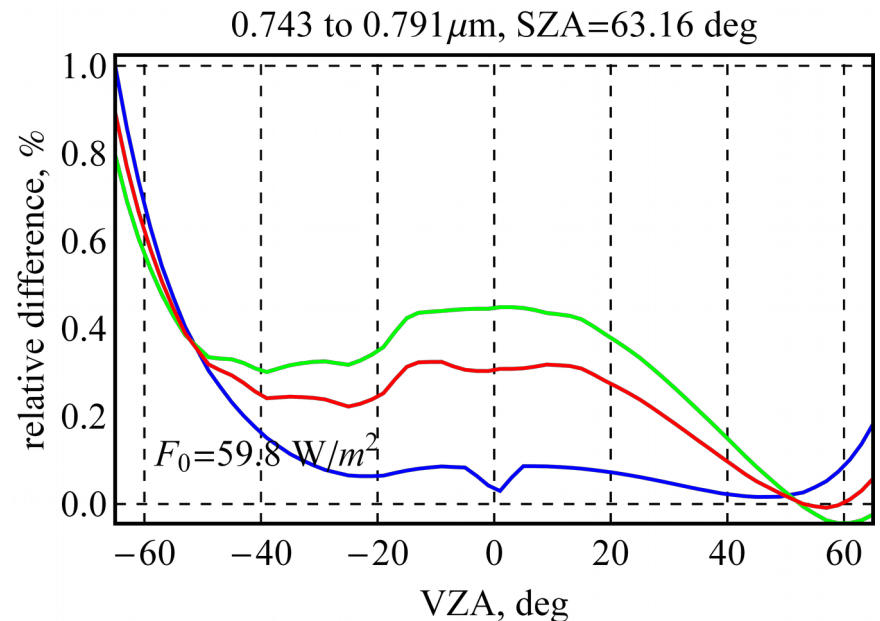
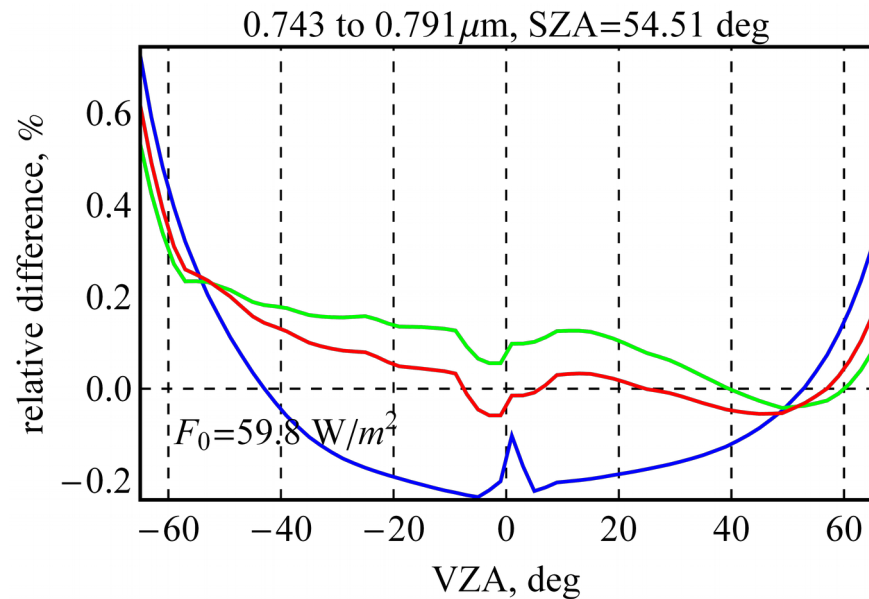
Relative error of band radiance over spectral interval 0.667  $\mu\text{m}$  through 0.684  $\mu\text{m}$ : **blue** – snowpack+atmosphere ARF (model with measurable quantity), **green** – the same as **blue** but ARF at 0.8  $\mu\text{m}$ , **red** – the same as **green** but with interpolation over SZA. RAA = 63° for positive VZA, RAA = 117° negative.

# Modeling results: TOA radiance, band 18



band radiance over spectral interval 0.743  $\mu\text{m}$  through 0.791  $\mu\text{m}$ : black – snowpack-only ARF, blue – snowpack+atmosphere ARF (model of measurable quantity), green – the same as blue but ARF at 0.8  $\mu\text{m}$ , red – the same as green but with interpolation over SZA. RAA = 63° for positive VZA, RAA = 117° negative.

# Modeling results: relative error, band 18



Relative error of band radiance over spectral interval 0.743  $\mu\text{m}$  through 0.791  $\mu\text{m}$ : **blue** – snowpack+atmosphere ARF (model of measurable quantity), **green** – the same as **blue** but ARF at 0.8  $\mu\text{m}$ , **red** – the same as **green** but with interpolation over SZA. RAA = 63° for positive VZA, RAA = 117° negative.